

# An efficient adjoint computation for flow control problems

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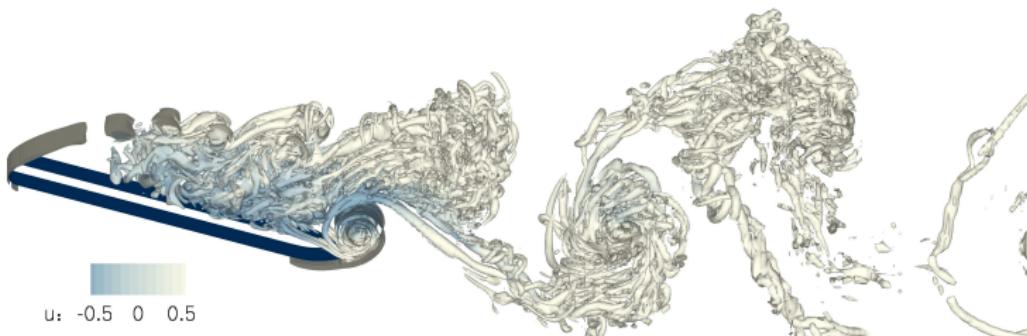
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# Outline

- ① Motivation
- ② Semtex
- ③ Adjoint calculation
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# Motivation



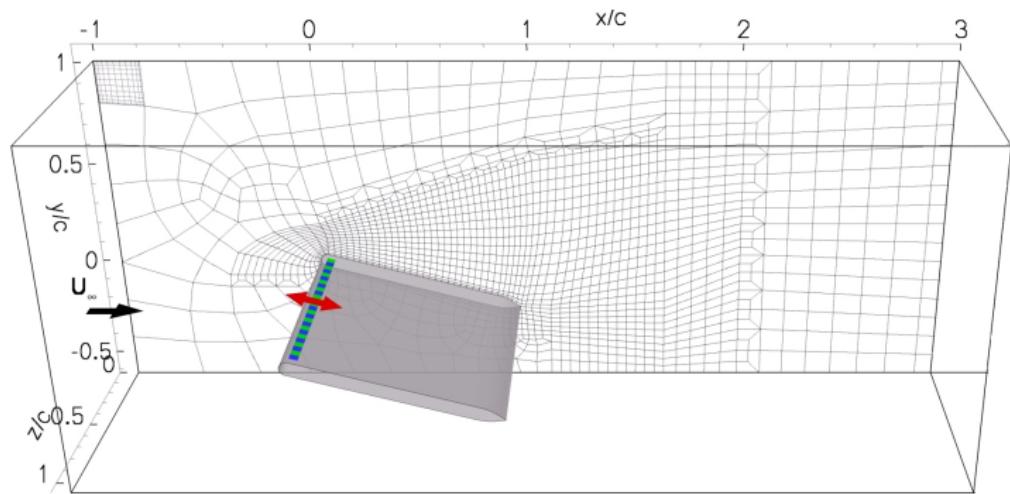
[T. Albrecht, J. Stiller, Proc. 3rd iTi Conf. Turbulence, 2008]

coupling advanced methods of physical numerical models and  
methods of mathematical control

→ improvement of flow qualities

aim: control transient/turbulent flows with high Reynolds numbers

- complex physical background → fine mesh



[T. Albrecht, J. Stiller, Proc. 3rd iTi Conf. Turbulence, 2008]

- appropriate small time steps
- for long-time simulation: high number of steps
- turbulence require a 3-D simulation

# Semtex

- numerical simulation of fluid dynamics
- solve time dependent Navier-Stokes equations

$$\frac{\delta \mathbf{u}}{\delta t} + \nabla p = \nu \Delta \mathbf{u} - (\mathbf{u} \cdot \nabla) \mathbf{u} + \mathbf{q}$$

- spectral element method
  - high order finite element technique
  - combination of geometric flexibility of finite elements and high accuracy of spectral methods
- using:
  - parametrically mapped quadrilateral elements
  - Gauss-Lobatto-Legendre nodal shape function basis
  - continuous Galerkin projection

# Modifications in Semtex

definition of a functional to minimize aerodynamic resistance  
 → minimize the momentum thickness using force  $q$



$$J(x, q) = \sum_{n=1}^N \int_{t_{n-1}}^{t_n} \int_{y_{down}}^{y_{up}} \frac{u}{u_0} \left(1 - \frac{u}{u_0}\right) dy dt + \mu \|q\|^2 \rightarrow \min!$$

$x = (u, v)$     $u_0$  inflow velocity in horizontal direction

## Flow control

optimization by using body forces

- high dimensional optimal control problem
- calculate gradients by using adjoint informations  
to reduce the effort

## Adjoint calculation

different techniques: algorithmic differentiation

discretization of continuous adjoint  
hand coded

...

# Gradient Calculation (Time Integration)

- ① Forward integration (flow simulation)

$$x_{i+1} = F_i(x_i, q_i), \quad i = 1, \dots, I$$

with  $x_i \in \mathbb{R}^n$  state,  $q_i$  control at time  $t_i$

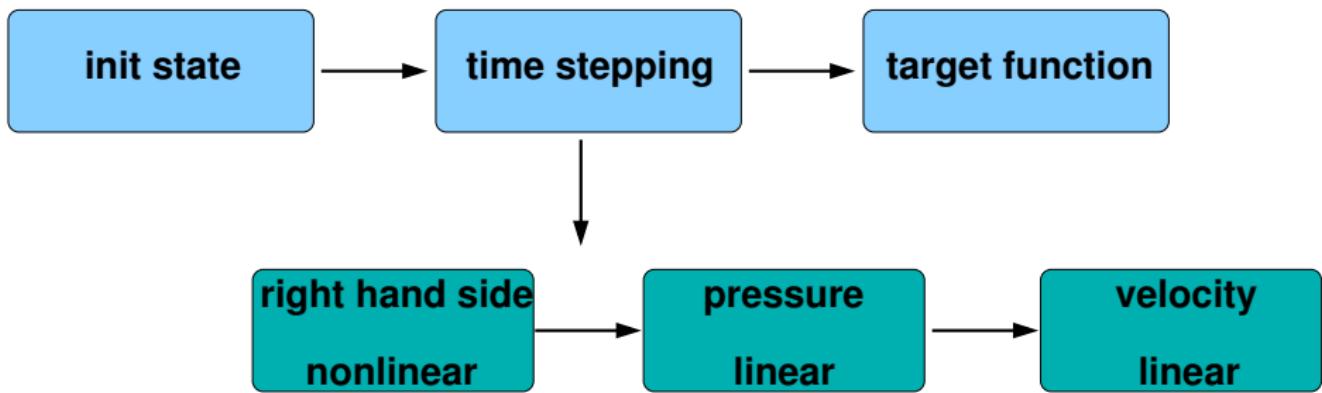
number of time steps / known

- ② Evaluation of **target function**  $J(x, q)$

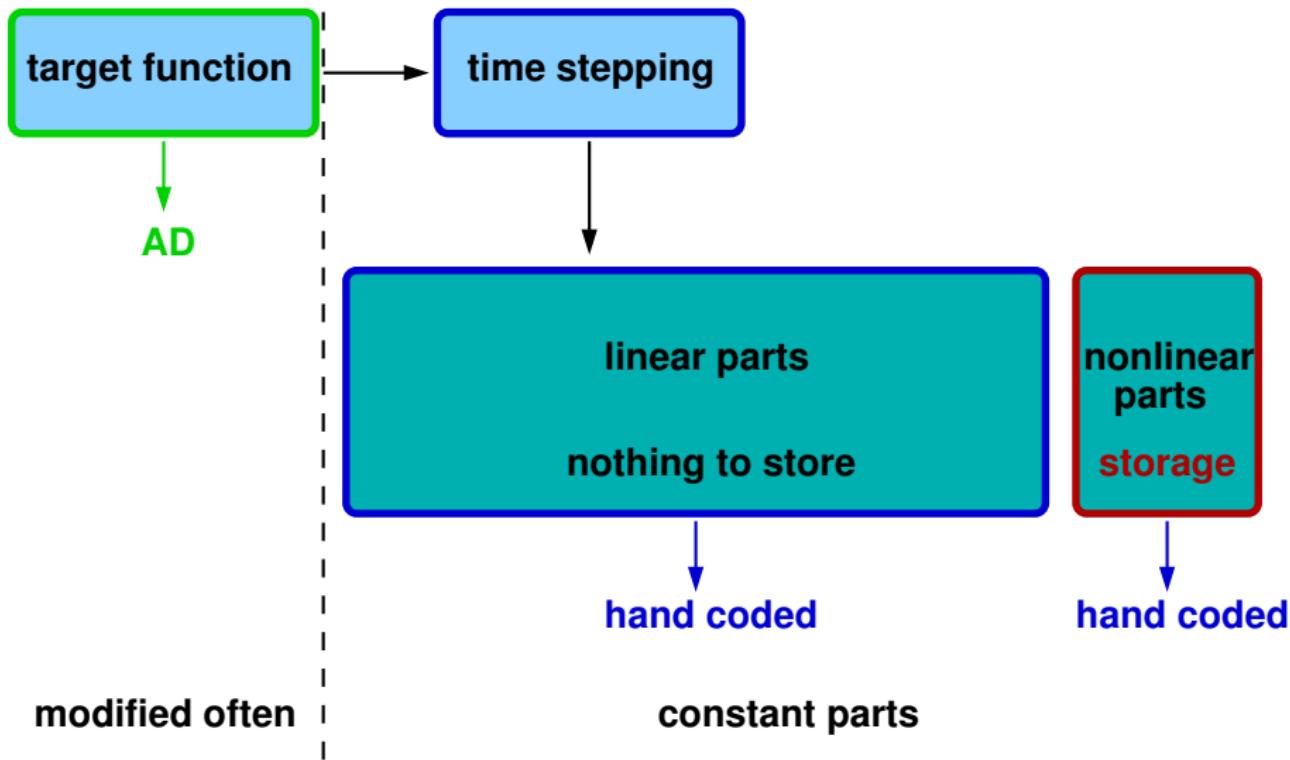
- ③ Reverse integration:

$$\bar{x}_{i-1} = \bar{F}_i(\bar{x}_i, \mathbf{x}_{i-1}, q_{i-1}, q_i), \quad i = I, \dots, 1$$

- ④ Gradient calculation



Adjoint?



# Algorithmic Differentiation (AD)

Differentiation of “computer programs” within machine precision

**Basic forms:** [Griewank/Walther 2008]

forward mode:  $\text{OPS}(\textcolor{blue}{F}'(x)\dot{x}) \leq c_1 \text{OPS}(F), c_1 \in [2, 5/2]$

reverse mode:  $\text{OPS}(\bar{y}^T F'(x)) \leq c_2 \text{OPS}(F), c_2 \in [3, 4]$   
 $\text{MEM}(\bar{y}^T F'(x)) \sim \text{OPS}(F)$

combination:  $\text{OPS}(\bar{y}^T F''(x)\dot{x}) \leq c_3 \text{OPS}(F), c_3 \in [7, 10]$

**Tasks:**

Derivatives (of any order)

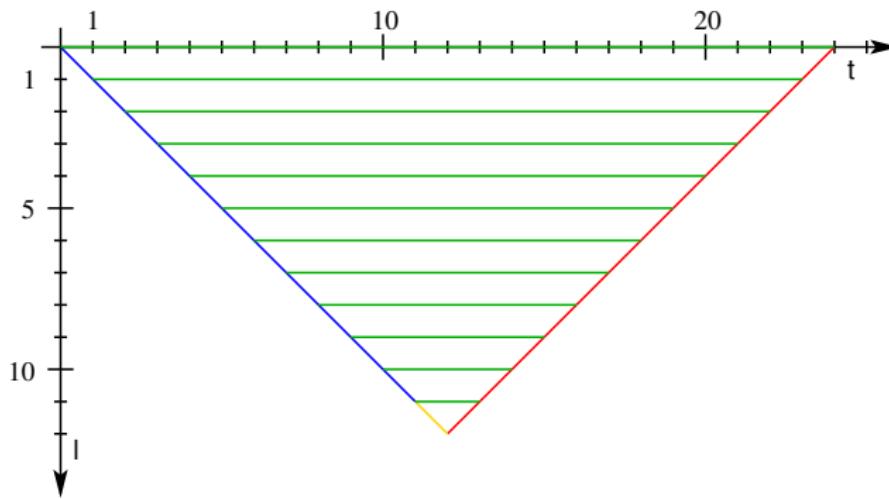
**Important topics:**

Advanced AD?

(sparsity patterns, structure exploitation, time-stepping, ...)

# Store-Everything Approach

Example: 12 time steps



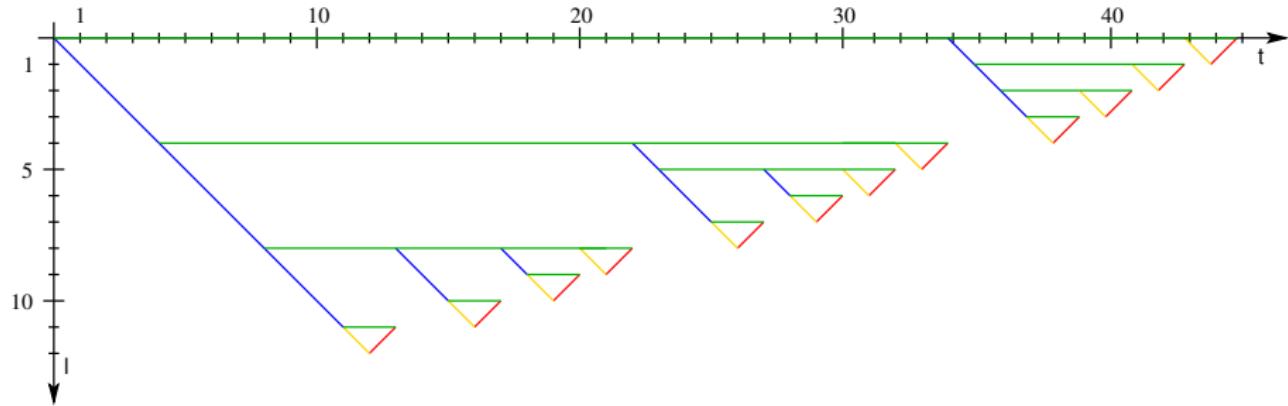
→  $\text{MEM} = O(l)$      $t = 2l$     here:  $\#\text{eval}(F_i) = 12$      $t = 24$

# Binomial Checkpointing

Example: 12 time steps, 3 checkpoints and reusage of all checkpoints!

## Binomial Checkpointing

Example: 12 time steps, 3 checkpoints and reusage of all checkpoints!



→  $\text{MEM} = c \quad t = ? \quad \text{here: } c=3 \quad \#\text{eval}(F_i) = 21 \quad t=45$

## Theorem (Complexity Result (Binomial Checkpointing))

*Given*

$I$  = total number of time steps to be reversed

$c$  = number of checkpoints that can be used

$r$  = unique integer satisfying

$$\beta(c, r - 1) < I \leq \beta(c, r) \equiv \binom{c+r}{c}$$

→ Minimal number of forward steps required is given by

$$t(c, I) = rl - \beta(c + 1, r - 1) + 1$$

**Proof:** Based on induction (Griewank, Walther 2000)

## Numerical results

simulation of flows with  $Re = 10^4$ :

- spectral element mesh with 1757 elements
- polynomial order  $N = 12$

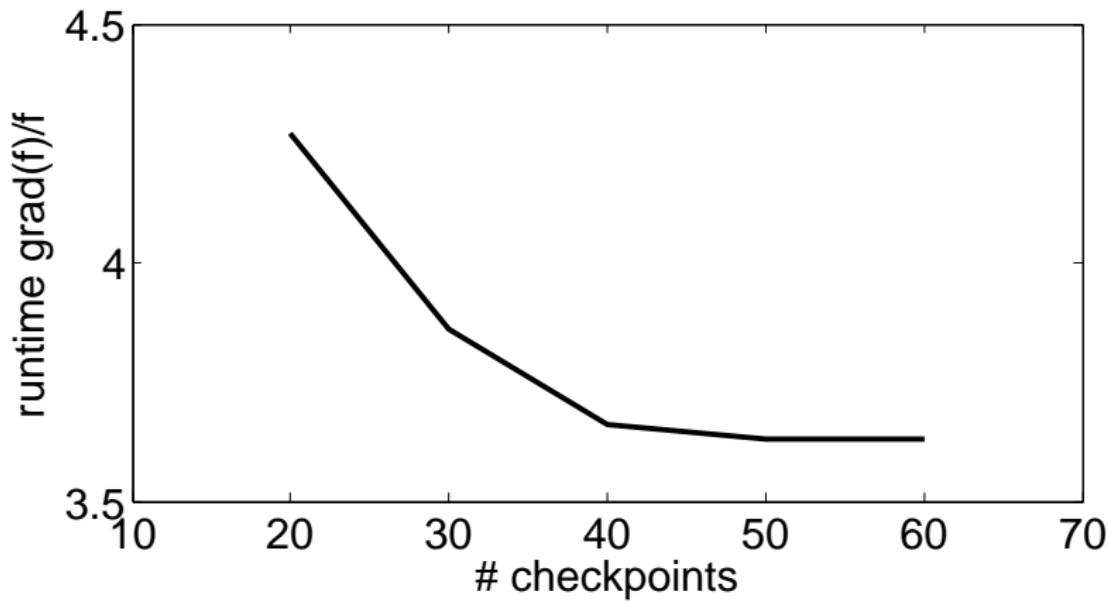
→ acceptable level of divergence errors

execution time of one time step: 6.13s

execution time of one adjoint time step: 7.92s

→ ratio: 1.3

Comparison of flow simulation runtime with adjoint calculation  
with 500 steps for 20, 30, 40, 50 and 60 checkpoints:



# Outlook

**Goal:** adjoint-based control of turbulent flows  
using electromagnetic fields

**Applications:** aerodynamics, crystal growth

**Done:**

- extension of a target function for optimization
- inclusion of hand coded adjoints and AD applications
- coupling with optimal checkpointing

**Then:**

- optimal control and experiments
- development of optimization strategies for turbulent flows